# Using Model Checking to Validate AI Planner Domain Models

John Penix, Charles Pecheur and Klaus Havelund

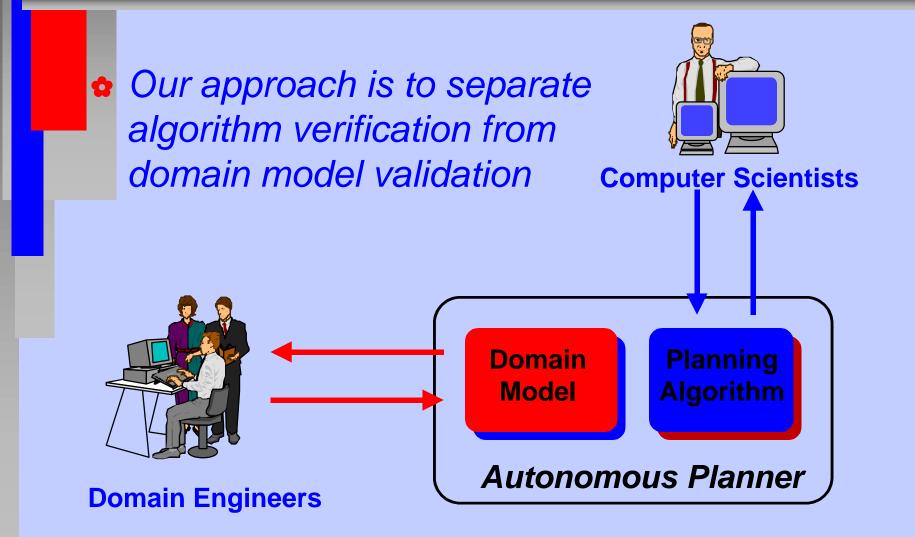
Automated Software Engineering
NASA Ames Research Center

### The Problem: High-Assurance Autonomous Systems

- Long lifetimes
- Limited Access
- Reactive/Adaptive
- Agent-Based Architectures
- Advanced Algorithms
- Knowledge-Based



## Verification and Validation of Autonomous Planning Systems



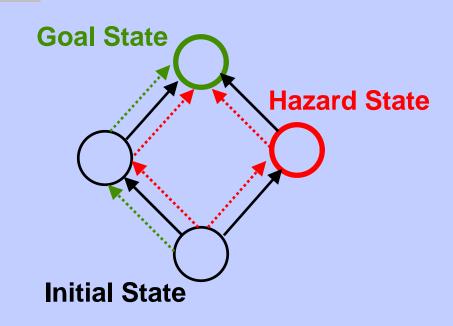
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### Model Checking

- Technique for verification of finite-state systems traditionally used for hardware
- Determines whether a FSM is a "model" of a temporal logic formula
- Exhaustive evaluates all possible executions of events in the system
- Allows non-deterministic modeling/abstraction of the "environment"
- Limited by "state space explosion"

### Model Checking vs. Planning

Exhaustive model checking algorithms can find flaws in domain models that may not be discovered by testing with a heuristic planner



The planner may find a path to the goal without discovering the hazard state.

Model checking tries all paths and finds the hazard state.

## The HSTS Planner's Domain Description Language

Object-oriented data structures with qualitative and quantitative constraints on variable values

Robot

:state variables

At:  $\{A,B,C\}$ 

Task: {Move,Fix,Rest}

Charge: {Empty,Full}

Hole

:state variables

At:  $\{A,B,C\}$ 

Status: {Exists,Fixed}

((Robot.Task=Fix) starts\_before (10 20) (Hole.Status = Fixed))

### Model Checking for DDL

- We developed a translation from a DDL model to a finite state transition model
- Tested the translation on 3 model checkers:
  - Spin (from Bell Labs)
  - Murphi (from Stanford University)
  - SMV (from Carnegie Mellon University)

#### Results: Expressibility

- General translation to finite state transition model able to express qualitative constraints with temporal locality
- No support for quantitative constraints
- Temporally distant relationships require special consideration:
  - history variables in Spin & Murphi
  - fairness constraints in SMV

#### Results: Performance

- Experimented on "small" model of autonomous robot with 65 temporal constraints
- The model had 16320 reachable states out of 559872 potential states (highly constrained)
- Exhaustive verification with Spin & Murphi in under 30 seconds
- Exhaustive verification with SMV in 0.05 seconds (due to better target language)



Model checking "error traces" are plansAble to perform analysis that are not directly

supported by testing with the planner:

- Is there a plan (a path from an initial state to a goal state) for any legal initial state?
- Is there a plan for every legal initial state?
- ♠ Is there a plan from every reachable state?
- Can I reach a state where X is true?

#### **Conclusions**

- Model checking has the potential to overcome limits to model validation using a planner
- Model checking can be used to effectively validate "simple" domain models
- ♣ Further experiments are necessary to see if temporally distant relations and quantitative constraints can be effectively supported